



# Operational considerations and data science needs for a large heterogeneous network

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With credit to IIT Space Weather Lab students and conversations with colleagues.

# SWON focus areas

- Geomagnetically induced currents
  - Thermospheric expansion
  - Ionospheric disturbances
  - The aurora
- 
- For the operational system to be successful, specific objectives should be identified for each area.

# Example: Distributed sensing

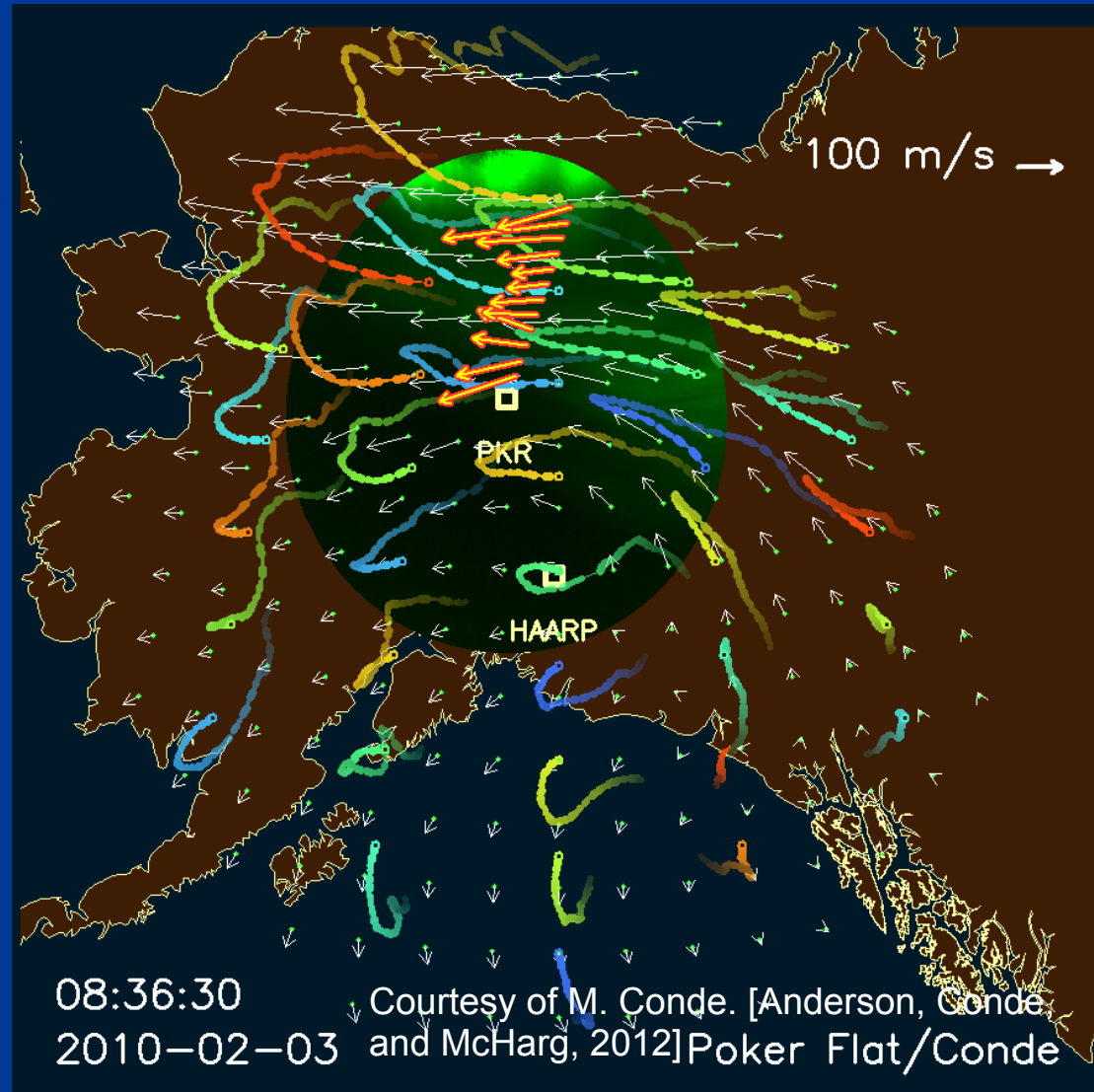
e.g., Objective: to enable auroral forecasts

What is the service?

- Provision of data
- What latency, what rate, synchronization, what levels data products, what scale sizes?
- Real-time science required?

Who are the users?

- Modelers, data assimilators, instrument developers? The public?



# Example: Sunburst system

- e.g., provide evidence of GICs
- EPRI project measuring GIC events in actual systems
- <http://sunburstproject.net/index.html>

## EPRI SUNBURST Project

### Project News

The new EPRI SUNBURST Project website is beginning to come alive. This page and this website will be undergoing frequent significant changes as we progress with development of each feature.

Links for the various tools are on the right. The only tools currently active are the historical data tool and the latest GIC readings. When you click on those links, you will be asked to enter your user id and password.

### About The Project

The EPRI SUNBURST Project is a collaborative project for monitoring of geomagnetically-induced currents (GIC's) and their impact on the power grid.

### SUNBURST Tools

- [Monitoring Map](#)
- [Real-time Data](#)
- [Storm Catalog](#)
- [Active Alerts](#)
- [Historical Data](#)
- [Latest GIC Readings](#)

# Metrics

- Metrics for successful operation of each objective should be defined.
- Requirements would then follow, for each metric.
- The metrics may actually be competing and require tradeoffs in system design.
  - E.g., availability, network resolution vs coverage, latency, rate

# Example

- Federal Aviation Administration's Wide Area Augmentation System (WAAS)
  - Distributed homogeneous array for ionospheric monitoring with master control stations processing for near real-time broadcast
- Objective: to provide precision approach service for civilian aircraft using GPS
  - Primary guidance down to 200 ft height for Category I service.
- Metrics: accuracy, integrity, availability, continuity
  - Formally defined probabilistically, e.g., probability of hazardously misleading information  $10^{-7}$  per approach
  - Risk trees, prior probabilities of faults

# Requirements

- Heterogeneous network: system of subsystems approach
  - Define requirements for each at network level, and if needed, at individual unit level.
- Performance-based requirements vs. instrument-specific requirements
  - Trades off generality and modularity of network for ease of quantification
- Life cycle
  - OSSEs
  - Test-bed
  - Full system in phases
  - Upgrades
  - Winding down/obsolescence
- Data training sets, validation sets.



# Standardization and attention to user interface

- Lowers the barriers to research entry
- Example: Global Navigation Satellite System (GNSS) networks, e.g., International GNSS Service
  - Single repository with map and standardized recording of site history gives ease of use.
  - User-contributed
  - Nothing draws a crowd like a crowd!
  - Receiver INdependent EXchange (RINEX) format
    - » Text file header specifies which observables are provided
    - » One RINEX script covers 1000s of receivers!



# Example: UNAVCO

The screenshot displays the UNAVCO website interface. At the top, there is a navigation bar with links for HOME, ABOUT, CONTACT, and HELP, alongside a search bar. Below this is a secondary menu with categories: Community, Projects (highlighted), Instrumentation, Data, Software, Science, and Education. A large banner image shows a mountainous landscape with snow patches. Below the banner, a tagline reads: "UNAVCO, A NON-PROFIT UNIVERSITY-GOVERNED CONSORTIUM, FACILITATES GEOSCIENCE RESEARCH AND EDUCATION USING GEODESY."

The main content area is divided into three columns:

- Left Column:** An "Index" sidebar with links to "Help with Projects", "Project Support & Services", "Major Projects", "Other Projects", and "Past Projects".
- Middle Column:** A "Projects" section with a sub-header "Help with Projects" and a corresponding image of a person using surveying equipment. Below this is a "Project Support & Services" section with an image of a field station in a snowy environment.
- Right Column:** A "Projects" section with a detailed paragraph about UNAVCO's support for principal investigators (PIs) and a list of major projects. Below this are three sub-sections: "Broader Impacts Proposal Guidance", "Letters of Support", and "GPS/GNSS Support".



# Data science needs

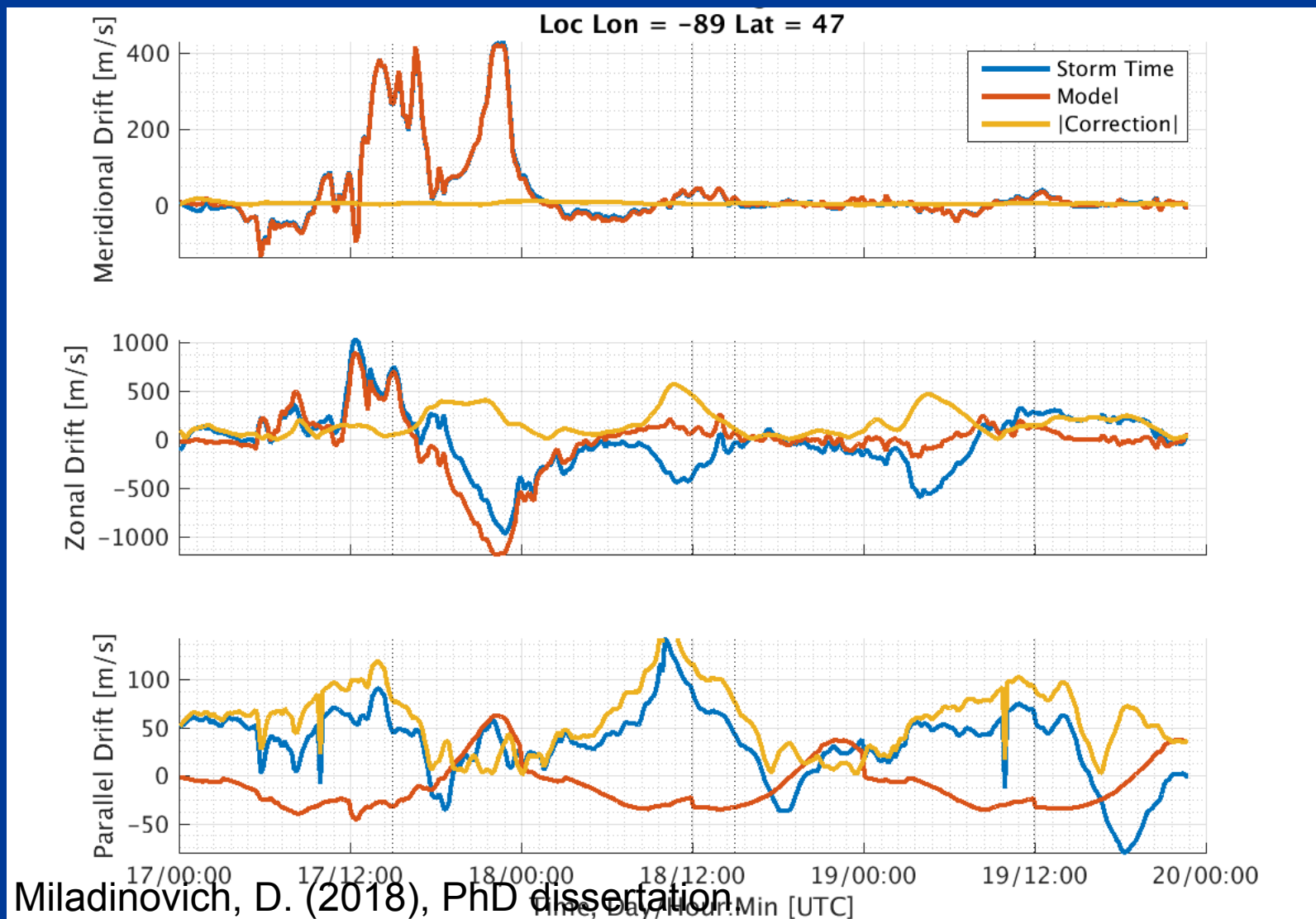
- User-based requirements, e.g., data assimilators may want to provide
  - Forecasting with uncertainty quantification
  - Actionable forecasts for space weather
- How much overlap between understanding (modeling) and prediction (data assimilation) is required?
  - No number of measurements or observations would give all possible states/parameters
  - Deterministic vs probabilistic approaches



# Error modeling

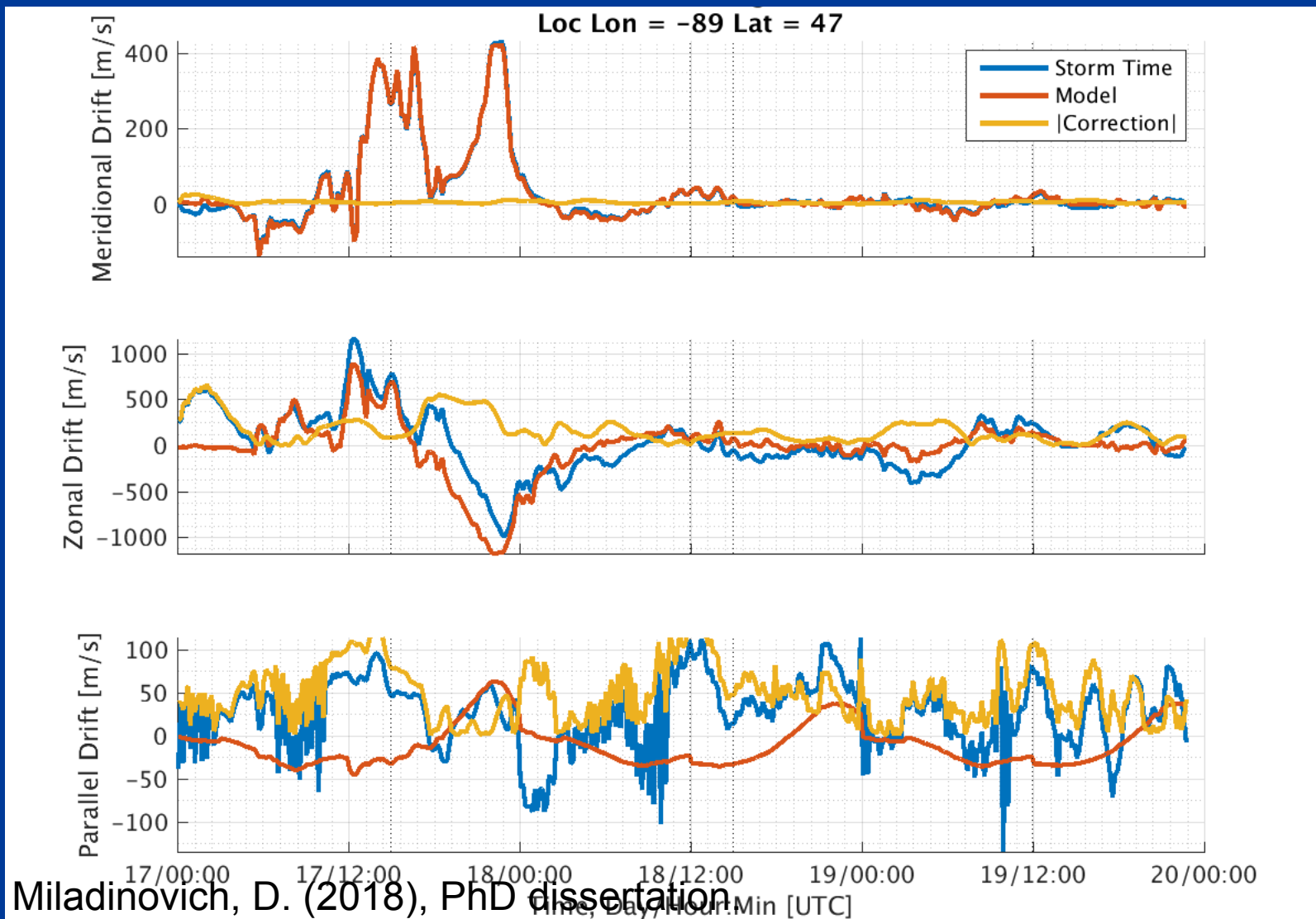
- One challenge of applied data-driven methods for the MIT system is error characterization both of measurements and underlying models
- Why needed?
  - Measurement error models are needed for accuracy and integrity (“trustability”).
  - Model uncertainties – a broader problem for all fields
  - Significantly influence results of data assimilation when using optimized methods.

# Example: Assimilation of Ne, for $\Phi$ and $u$



Miladinovich, D. (2018), PhD dissertation

# Assimilation of Ne and u, for $\Phi$ and u



Miladinovich, D. (2018), PhD dissertation



# Summary of areas of thought/ discussion

- Operational considerations
  - Objectives – understanding vs prediction not identical
  - User need-based metrics and requirements
  - Life cycle from test-bed to phases, to upgrades, to winding down?
  - Services to enable user productivity
- Data science needs
  - Measurement error models
  - As users, algorithm developers of filtering/learning methods need process and measurement noise characterization